

The Performance of the Kernel Regression Model for Assessing the Impact of Money Supply on Industrial Growth in Nigeria

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ABSTRACT

This study examined the performance of the kernel model over the linear regression model for a real-life application in Nigeria. The linear regression and kernel regression model was used to assess the impact of the volume of money supply in Nigeria on industrial growth in Nigeria. The source of data for this study was the secondary source of data collection. Findings showed that there exist a weak positive coefficient of determination measure between volume of money supply and industrial growth which implies that the volume of money weakly explains the total amount of variation in industrial growth using the linear regression model while the kernel model found a strong positive coefficient of determination value which implies that the kernel model was adequate and far better than the linear model for estimating industrial growth in Nigeria. Also, it was found that volume of the money supply does not impact significantly on industrial growth in Nigeria using the linear model while it was found that volume of money impacts significantly on industrial growth using the kernel model. Further findings showed that the residual standard error value for the smoothed model is relatively more efficient than that of the linear model which was attributed to the performance of the kernel regression model.

Keywords: Coefficient of Determination, Industrial growth, Kernel model, Linear model, Volume of money supply.

1.0 INTRODUCTION

Over the past decade, researcher in applied mathematics and econometrics has shown keen interest on studies relating to how industrial output(s) affect the economy of most countries especially developing economies (Obioma *et al.*, 2015). Very few countries have been able to grow and accumulate wealth without investing in their industries, and a strong and successful manufacturing sector usually precipitates industrialization. The industrial sector has been widely considered to be ideal to drive Africa's development. This is due to the labor-intensive, export- focused nature of the industrial sector of any economy. There exist a direct correlation between exportation levels and the economic success of a country. By increasingly adding value to products before they are sold, revenues are boosted, thereby raising average earnings per input. Industrial development involves the application of modern technology, equipment's and machineries for the production of goods and services, alleviating human suffering and to ensure continuous improvement in their welfare. Industrialization has come to be regarded as a crucial and powerful engine in the overall development process. The World Bank has classified Nigeria as inward oriented by trade orientation. Using data for 1963 – 73 and 1973 – 1985, Nigeria was deemed moderately inward oriented for the production period 1963 – 1973, but strongly inward oriented for the period 1973 – 1985. Since 2001, Nigeria has enjoyed a long period of sustained expansion of the non-oil economy, with growth occurring across all sectors of the economy and accelerating at about 7%. This growth rate increased to about 8-9% in 2003 despite the financial crisis. This has more than doubled the growth rate in the country prior to 1999. Even in the wake of the global financial crisis in 2009, Nigeria's growth performance fell only to about 4.5 percent.

The aim of this study is assess the performance of the Kernel regression model for estimating the impact of money supply on and industrial growth in Nigeria.

2.0 LITERATURE REVIEW

According to Fashola (2004), modern industrial activities are characterized by high technological innovations, the development of managerial and entrepreneurial talents and improvement in technical skills which normally promote productivity and better living conditions. In recognition of this, successive governments in Nigeria have continued to articulate policy measures and programme to achieve industrial growth and development.

Dauda (2006) stated that if the country's industrial aspirations are to achieve the provision of adequate finance should be accorded high priority. But regrettably, Nigerian industrialists have been badly starved of this very important ingredient for both the establishment and maintenance of industries and could be evidently seen in the following areas; inadequate initial capital for startup, inadequate funds for maintaining existing industries, insufficient funds for expansion. The lack of funds and enabling environment for industrialists has greatly denied the nation the capacity of achieving significant industrial growth or industrialization which Nigeria has always hoped and craved for. He added that the quest to determine to what extent that industrial development have contributed to our economic growth should be paramount.

Hamison (2009) reports the existence of divergence between the growth of real earnings and productivity in the US and Canada, but this result is obtained largely from rising earnings inequality (i.e. increases in the top one per cent of the income distribution alongside stagnant or falling income shares elsewhere). There are also, important measurement issues affecting the observed decline in labour earnings, such as when taking account of the depreciation of fixed assets, which has increased as a result of adoption of new technologies, and which has tended to push the labour share downwards.

Mishel and Shierholz (2011) describe a widening gap between growth rates of productivity and wages (and labour compensation, including bonus payments). Labour compensation growth was particularly low in the private sector, while the growth of average wages was particularly weak for college educated public sector workers.

3.0 MATERIALS AND METHOD

3.1 Source of Data

The source of data for the study was secondary source of data collection obtained from the Central Bank of Nigeria Statistical Bulletin 2016. The obtained data comprises of annual data on volume of money supply and industrial gross domestic product.

3.2 Kernel Regression Analysis

The kernel regression is a non-parametric technique in statistics to estimate the conditional expectation of a random variable. The main objective is to find a non-linear relation between a pair of random variables X and Y .

The aim of the non-parametric regression model is to estimate the functional relation between Y and X . This implies that the conditional expectation of a variable Y relative to a variable X can be expressed as

$$E(Y | X) = m(X) \quad (1)$$

Where, m is an unknown function to be estimated

The relationship in a kernel model can be modeled as:

$$Y_i = m(x_i) + \varepsilon_i, \quad i = 1, \dots, N, \quad \forall E(\varepsilon_i) = 0 \quad (2)$$

Note that : $m(\cdot) = E[y | x]$ if $E(\varepsilon_i | x) = 0$

3.3 Kernel Smoothing Techniques

A conceptually simple approach to represent the weight sequence in the local averaging method is to represent the weights distribution by a density function which contains a scale parameter that adjust the size and the form of the weights according to the location of the point with respect to the point of estimation x (Nadaraya, 1964). This density function is known as the kernel function k . smoothing techniques based on this kind of weight representation are called kernel smoothing. The kernel estimate $m(x)$, is defined as a weighted average of the response variable in a fixed neighborhood around x , determined in shape by the kernel function k and bandwidth h . The kernel used in this study is the Nadaraya-Watson estimator.

3.4.1 The Nadaraya-Watson estimator

The Nadaraya-Watson estimator estimates the kernel $m(x)$ which is extracted with a bandwidth h and expressed as

$$m(x_i) = n^{-1} \sum_{i=1}^n W_{hi}(x) Y_i \quad (3)$$

The weight sequence is written as

$$W_{hi}(x) = \frac{K_h(x - X_i)}{f_h(x)} \quad (4)$$

where,

$$f_h(x) = n^{-1} \sum_{i=1}^n K_h(x - X_i) \quad (5)$$

and in which

$$K_h(u) = \frac{1}{h} K\left(\frac{u}{h}\right) \text{ is the kernel with scale factor } h$$

$m(x) = \frac{n^{-1} \sum_{i=1}^n K_h(x - X_i) Y_i}{n^{-1} \sum_{i=1}^n K_h(x - X_i)}$ is proposed by Nadaraya (1964) and Watson (1964) and often called the Nadaraya-Watson estimator.

$$m(x) = \frac{\sum_{i=1}^n K_h(x - X_i) Y_i}{\sum_{i=1}^n K_h(x - X_i)}$$

The shape of the kernel weights is determined by the kernel function k with the smoothing parameter h , which is called the bandwidth. The kernel function is a continuous, bounded and symmetric real function which integrates to one.

Different types of kernel exist and some of them were presented with their properties in table 1.

Table 1: Different Kernel and their properties

S/N	Kernel	Equation	R_k	d_k
1	Uniform	$K_0(u) = \frac{1}{2} I(u \leq 1)$	1/2	1/3
2	Epanechnikov	$K_1(u) = \frac{3}{4} (1 - u^2) I(u \leq 1)$	3/5	1/5
3	Biweight (Quadratic)	$K_2(u) = \frac{15}{16} (1 - u^2)^2 I(u \leq 1)$	5/7	1/7
4	Triweight (Tricube)	$K_3(u) = \frac{35}{32} (1 - u^2)^3 I(u \leq 1)$	350/429	1/9
5	Gaussian	$K_\phi(u) = \frac{1}{\sqrt{2\pi}} \exp\left(-\frac{u^2}{2}\right)$	$1/2\sqrt{\pi}$	1

Key: R_k = Roughness and d_k = variance

3.4 Model Specification

The model for this study is expressed as:

We shall obtain equation (3) by replacing $Y_i = IGDP_i$ and $X = VMS_i$ in equation (2)

$$IGDP_i = m(VMS_i) + \varepsilon_i, \quad i=1, \dots, n \quad (3)$$

$$\forall m(VMS) = n^{-1} \sum W_{n_i}(VMS) IGDP_i$$

where IGDP represents Industrial growth and VMS represents volume of money supply.

3.4 Data Presentation

Table 2: Distribution of Industrial GDP and Volume of Money Supply in Nigeria from 2001 – 2016

Years	Industrial GDP (Billion of Naira)	Volume of Money Supply (Billion of Naira)
2001	1874.08	816.70
2002	2042.72	946.30
2003	3037.71	1225.60
2004	4610.08	1330.70
2005	6094.89	1725.40
2006	7488.74	2280.60
2007	7975.50	3116.30
2008	9719.51	4857.30
2009	8071.07	5017.10
2010	15194.56	5571.30
2011	16263.08	6771.00
2012	5825.63	7420.95
2013	2642.89	7032.84
2014	4600.55	6904.79
2015	15073.79	7312.00
2016	3012.59	9864.00

Source: Central Bank of Nigeria Statistical Bulletin 2016.

4.0 DATA ANALYSIS AND INTERPRETATION

4.1 Assessing the impact of money supply on industrial Growth

We shall first model a linear regression model to assess the impact of the independent variable (volume of money supply) on the dependent variable (Industrial Growth).

4.1.1 Result of Linear Regression Analysis of industrial GDP (IGDP) on Volume of money supply (VMS)

Call:

lm(formula = IGDP ~ VMS)

Residuals:

Min	1Q	Median	3Q	Max
-7044904	-3103421	-91448	1847801	7917416

Coefficients:

	Estimate	Std. Error	t value	Pr(> t)
(Intercept)	4598264.9	2209612.0	2.081	0.0563
VMS	553.4	416.0	1.330	0.2047

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Residual standard error: 4663000 on 14 degrees of freedom

Multiple R-squared: 0.1122, Adjusted R-squared: 0.04881

F-statistic: 1.77 on 1 and 14 DF, p-value: 0.2047

Source: R-console 3.32

Interpretation

The result of the linear regression analysis found residual standard error value of 4663000, R-square value of 0.1122, F-statistic of 1.77 and a p-value of 0.2047. This result indicates a weak coefficient of determination value and implies that the model is inadequate for estimating industrial growth. Also, it was found that volume of money supply does not impact significantly on industrial growth since p-value of 0.2047 is greater than critical value of 0.05, assuming 95% confidence level.

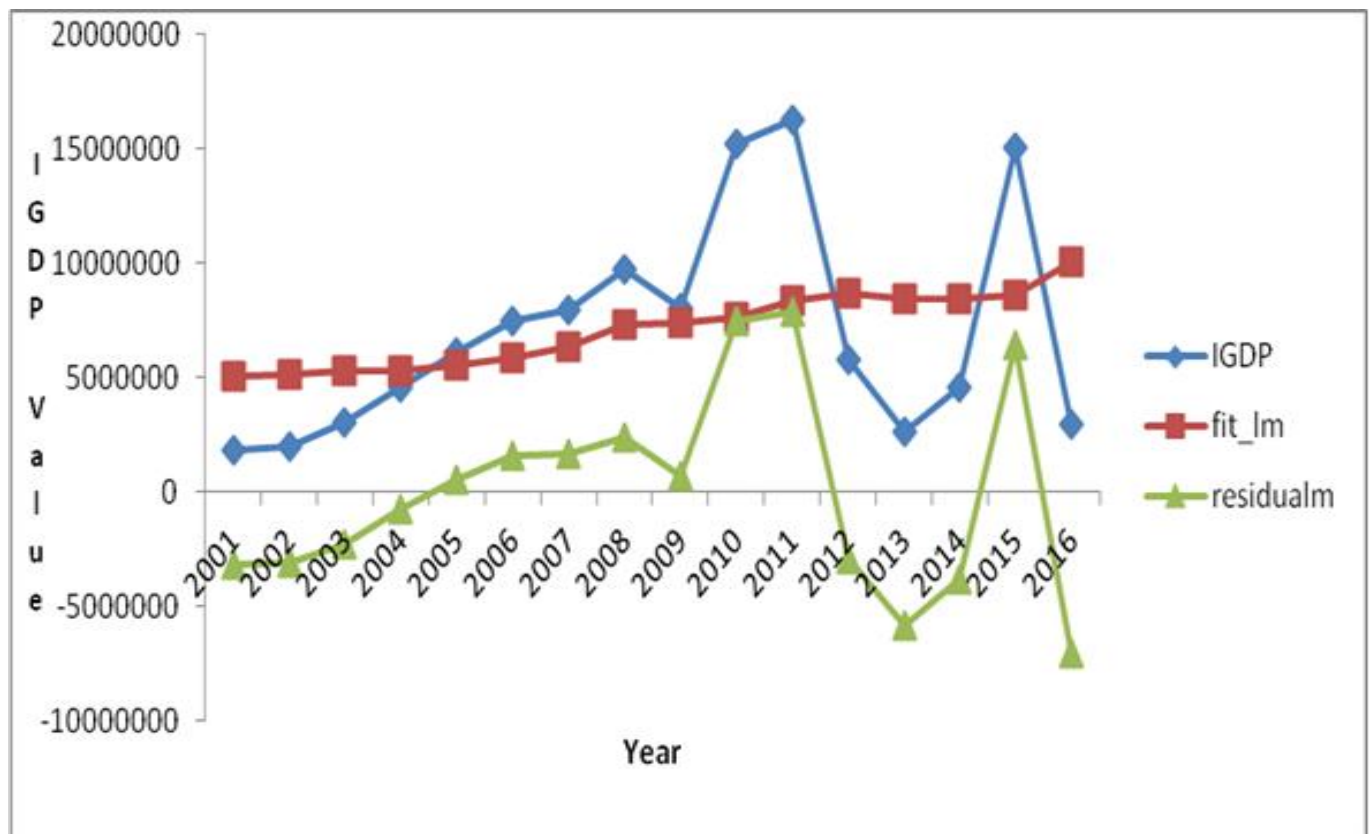


Figure 1: Graph showing Observed IGDP, fitted IGDP and Residual for the linear model

The result of figure 1 validates the result obtained above since the fitted value does not fluctuate like the observed value.

4.1.2 Result of Kernel Linear Regression Analysis of industrial growth (IGDP) on Volume of money supply (VMS)

Continuous Kernel Type: Second-Order Gaussian
 No. Continuous Explanatory Vars.: 1
 Regression Data (16 observations, 1 variable(s)):
 VMS
 Bandwidth(s): 1751.18
 Regression Type: Local-Constant
 Bandwidth Selection Method: Least Squares Cross-Validation
 Formula: IGDP ~ VMS
 Bandwidth Type: Fixed

Objective Function Value: 20475472 (achieved on multistart 1)

Kernel Regression Estimator: Local-Constant

Bandwidth Type: Fixed

Residual standard error: 3768207

R-squared: 0.5598028

Continuous Kernel Type: Second-Order Gaussian

Kernel Regression Significance Test

Type I Test with IID Bootstrap (399 replications, Pivot = TRUE, joint = FALSE)

Explanatory variables tested for significance: VMS (1)

Individual Significance Tests

P Value: VMS < 2.22e-16 ***

Signif. Codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

Interpretation

The result of the kernel linear regression analysis found residual standard error value of 3768207, R-square value of 0.5598, bandwidth of 1751.18 and a p-value of 0.00. This result indicates a positive coefficient of determination value and implies that the model adequate for estimating unemployment rate. Also, it was found that volume of money supply impacts significantly on industrial growth using the smoothed model since p-value of 0.00 is less than critical value of 0.05, assuming 95% confidence level. In addition, it was observed that the residual standard error value of 3768207 for the smoothed model is relatively more efficient than that of the linear model with a residual standard error value of 4663000 which was attributed to the performance of the kernel regression model.

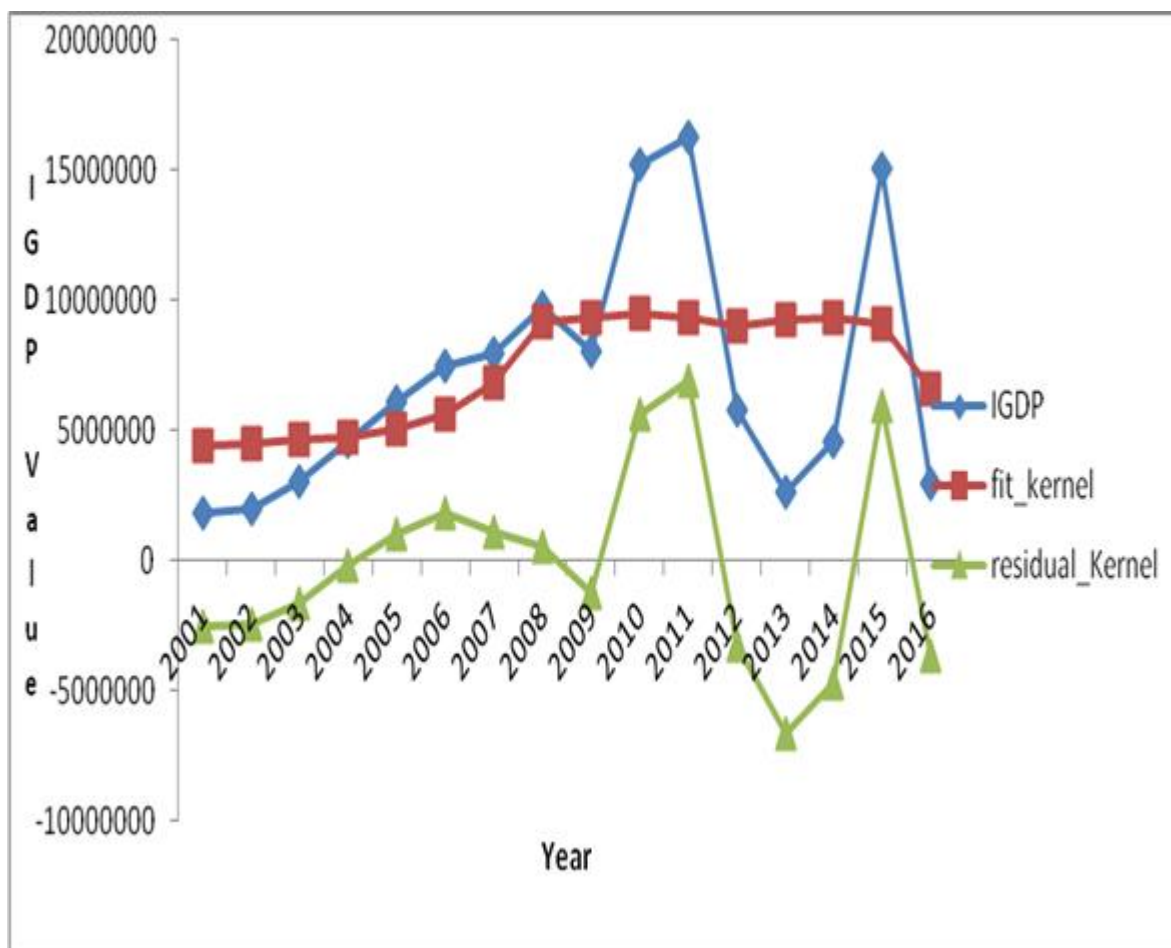


Figure 2: Graph showing Observed IGDP, fitted IGDP and Residual for the Kernel linear model

The result of figure 1 validates the result obtained in section 4.1.2 since the fitted value fluctuate like the observed value.

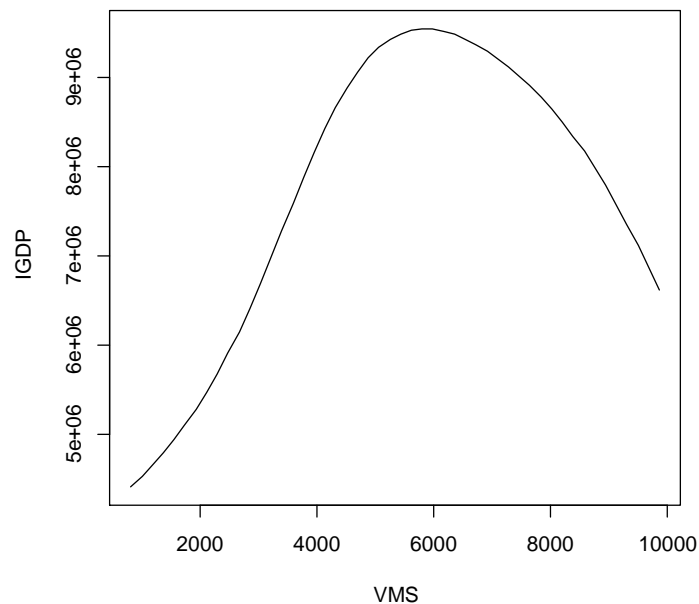


Figure 3: Graph showing industrial GDP against Volume of Money Supply

Table 3: Summary of Observed, fitted values and Residual for Linear Regression model and Kernel Linear Regression Model for estimating Industrial GDP

Years	IGDP	fit_lm	Residua_lm	fit_kernel	Residual_Kernel
2001	1874083	5050433	-3176350	4410532	-2536448.9
2002	2042716	5121828	-3079112	4489760	-2447044
2003	3037706	5276793	-2239087	4678154	-1640447.7
2004	4610084	5334906	-724822	4755268	-145184.4
2005	6094891	5552964	541926.5	5081467	1013423.9
2006	7488744	5860682	1628062	5660389	1828354.8
2007	7975498	6322812	1652686	6822767	1152730.8
2008	9719514	7286367	2433147	9201043	518471
2009	8071071	7374919	696152.3	9310739	-1239667.7
2010	15194561	7681529	7513032	9522160	5672401.5
2011	16263084	8345668	7917416	9353089	6909995.2
2012	5825630	8705410	-2879780	9045117	-3219487.3
2013	2642890	8490672	-5847782	9243745	-6600854.7
2014	4600548	8419830	-3819282	9299716	-4699167.6
2015	15073782	8645084	6428698	9105313	5968469.1
2016	3012582	10057486	-7044904	6616300	-3603718.4

Table 4: Summary of the result obtained for the Linear Regression model and Kernel Linear Regression Model

Model	Variables	R-square	P-value	Residual Standard Error
Linear	IGDP VMS	11.2%	0.205	4663000
Kernel	IGDP VMS	56.0%	0.00*	3768207

5.0 CONCLUSION

This study examined the performance of the kernel model over the linear regression model for a real life application in Nigeria. The kernel regression model is a nonparametric regression method that estimates the conditional expectation of a random variable with the sole objective of finding a non-linear relation between a pair of random variables. The linear and kernel model were used to assess the impact of volume of money supply in Nigeria on industrial growth in Nigeria.

Findings showed that there exist a weak positive coefficient of determination measure between volume of money supply and industrial growth which implies that the volume of money weakly explains the total amount of variation in industrial growth using the linear regression model while the kernel model found a strong positive coefficient of determination value which implies that the kernel model was adequate and far better than the linear model for estimating industrial growth in Nigeria.

Also, it was found that volume of money supply does not impact significantly on industrial growth in Nigeria using the linear model while it was found that volume of money impacts significantly on industrial growth using the kernel model.

Further findings showed that the residual standard error value for the smoothed model is relatively more efficient than that of the linear model which was attributed to the performance of the kernel regression model.

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APPENDIX

Rcode for computing the least-squares cross-validated bandwidths for the local constant estimator (default) of the variable IGDP and VMS

```
R> bw <- npregbw(formula=IGDP~VMS)
```

```
R> bw
```

Rcode for fitting the kernel model

We employ the bandwidths (bw) and fit the model and gradients

```
R> bw <- npregbw(formula= IGDP~VMS)
```

```
R> kmodel <- npreg(bws = bw, gradients = true)
```

```
R> summary(kmodel)
```

```
R> npsigtest(model)
```

```
R> model=lm(IGDP~VMS)
```